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FinalPrep.m --- ELEC 403 Final exam, this matlab file is used to do the various problems in the ELEC 403 textbook that are related to the final exam, of course the focus is on chapter 5 and chapter 7.

Prob 5.2 with jacobian $f(x) = x^2+2*y^2+4*x+4*y$

- REMEMBER THAT CHAPTER 5 only has SDM, Newton and Gauss-Newton*

```
syms x_1 x_2
f = x_1^2+2*x_2^2+4*x_1+4*x_2;
latex(f);
g=gradient(f);
latex(g);
f1 = x_1+2;
f2 = sqrt(2)*(x_2+1);
j=jacobian([f1,f2],[x_1,x_2]);
h = hessian(f);
%steep_desc3('func52','grad52',[-1; 1],1e-3);
gauss_newton('func52','grad52','jacob52',[-1; 1],1e-3);
```

```
Program gauss_newton.m
----- ITERATION 1 -----
STEP 1

xk =

    -1
     1

STEP 2

F_k =
```

3

STEP 3

$gk =$

2

8

$Jk =$

| | |
|--------|--------|
| 1.0000 | 0 |
| 0 | 1.4142 |

$Hk =$

| | |
|--------|--------|
| 2.0000 | 0 |
| 0 | 4.0000 |

STEP 4

$dk =$

| |
|---------|
| -1.0000 |
| -2.0000 |

STEP 5

$ak =$

1.0000

STEP 6

$adk =$

| |
|---------|
| -1.0000 |
| -2.0000 |

$er =$

2.2361

STEP 6

$xk =$

| |
|---------|
| -2.0000 |
| -1.0000 |

$F_{k1} =$

-6

----- ITERATION 2 -----

STEP 3

$gk =$

$1.0e-12 *$

0.4450

-0.2185

$Jk =$

1.0000 0

0 1.4142

$Hk =$

2.0000 0

0 4.0000

STEP 4

$dk =$

$1.0e-12 *$

-0.2225

0.0546

STEP 5

$ak =$

1

$adk =$

$1.0e-12 *$

-0.2225

0.0546

$er =$

9

STEP 6

$x_k =$

-2
-1

$F_{k1} =$

-6

----- ITERATION 3 -----
STEP 3

$g_k =$

0
0

$J_k =$

1.0000 0
0 1.4142

$H_k =$

2.0000 0
0 4.0000

STEP 4

$d_k =$

0
0

STEP 5

$a_k =$

1

$ad_k =$

0
0

$er =$

```

0

Solution point:

xs =

    -2
    -1

Objective function at the solution point:

fs =

    -6

Number of iterations performed:

k =

    3

```

Prob 5.2 with Newton

```
newton('func52','grad52','hess52',[0; 0],0.1,1e-3);
```

```

Program newton.m
----- ITERATION 1 -----
STEP 1

xk =

    0
    0

STEP 2

gk =

    4
    4

Hk =

    2    0
    0    4

STEP 3

dk =

```

```

        -2
        -1

STEP 4
Alpha: 1.000000000

er =

        2.2361

STEP 5

xk =

        -2
        -1

----- ITERATION 2 -----
STEP 2

gk =

        0
        0

Hk =

        2      0
        0      4

STEP 3

Hki =

        0.5000      0
           0      0.2500

dk =

        0
        0

STEP 4
Alpha: 1.000000000
STEP 5

adk =

        0
        0

```

Solution point:

xs =

*-2
-1*

Objective function at the solution point:

fs =

-6

Number of iterations performed:

k =

2

Prob 5.4 -- Find a good starting point besides $x_0 = [1 \ 1]$

```
syms x_1 x_2
f = 5*x_1^2-9*x_1*x_2+4.075*x_2^2+x_1;
latex(f);
g = gradient(f);
latex(g);
steep_desc3('func54','grad54',[-16; -17.9],1e-3);
h = hessian(f);
```

Program steep_desc3.m

----- ITERATION 1 -----

STEP 1

xk =

*-16.0000
-17.9000*

STEP 2

gk =

*2.1000
-1.8850*

dk =

-2.1000

```
1.8850

STEP 3
Alpha: 0.055180698
STEP 4
  xk+1: -16.115879466
  xk+1: -17.795984384
f(xk) = -8.148958e+00

xk =

-16.1159
-17.7960

----- ITERATION 2 -----
STEP 2

gk =

0.0051
0.0056

dk =

-0.0051
-0.0056

STEP 3
Alpha: 36.073499423
STEP 4

xk =

-16.2986
-17.9995

----- ITERATION 3 -----
STEP 2

gk =

0.0099
-0.0089

dk =

-0.0099
0.0089

STEP 3
Alpha: 0.055180697
```



```

STEP 4
Solution point:

xs =

    -16.299131032840879
    -17.999037136909219

Objective function at the solution point:

fs =

    -8.149999976794053

Number of iterations performed:

k =

     3

```

5.4 Using Newton

```

h = hessian(f);
latex(h)
newton('func54','grad54','hess54',[-10; -5],0.1,1e-6);

ans =

\left(\begin{array}{cc} 10 & -9 \\ -9 & \frac{163}{20} \end{array}\right)

Program newton.m
----- ITERATION 1 -----
STEP 1

xk =

    -10
     -5

STEP 2

gk =

    -54.0000
     49.2500

Hk =

```

```
10.0000  -9.0000
-9.0000   8.1500
```

STEP 3

dk =

```
-6.3000
-13.0000
```

STEP 4

Alpha: 0.945675721

er =

```
13.6613
```

STEP 5

xk =

```
-15.9578
-17.2938
```

----- ITERATION 2 -----
STEP 2

gk =

```
-2.9335
2.6755
```

Hk =

```
10.0000  -9.0000
-9.0000   8.1500
```

STEP 3

Hki =

```
16.3000  18.0000
18.0000  20.0000
```

dk =

```
-0.3422
-0.7062
```

STEP 4

Alpha: 1.000000000

STEP 5

$adk =$

-0.3422
-0.7062

$xk =$

-16.3000
-18.0000

----- ITERATION 3 -----
STEP 2

$gk =$

1.0e-13 *
0.5684
-0.5684

$Hk =$

10.0000 -9.0000
-9.0000 8.1500

STEP 3

$Hki =$

16.3000 18.0000
18.0000 20.0000

$dk =$

1.0e-12 *
0.0966
0.1137

STEP 4

Alpha: 1.000000000

STEP 5

$adk =$

1.0e-12 *
0.0966
0.1137

Solution point:

xs =

-16.3000000000000054
-18.0000000000000060

Objective function at the solution point:

fs =

-8.1499999999999963

Number of iterations performed:

k =

3

5.4 Using Gauss Newton

```
j = jacobian(f,[x_1,x_2]);
gauss_newton('func54','grad54','jacob54',[-16; -18],1e-3);
```

Program gauss_newton.m

----- ITERATION 1 -----

STEP 1

xk =

-16
-18

STEP 2

F_k =

-7.7000

STEP 3

gk =

3.0000
-2.7000

Jk =

3.0000 -2.7000

$Hk =$

18.0000 -16.2000
-16.2000 14.5800

STEP 4

$dk =$

-0.0920
0.0828

STEP 5

$ak =$

1.7993

STEP 6

$adk =$

-0.1656
0.1489

$er =$

0.2227

STEP 6

$xk =$

-16.1656
-17.8511

$F_{k1} =$

-8.1494

----- ITERATION 2 -----

STEP 3

$gk =$

0.0037
0.0041

$Jk =$

0.0037 0.0041

$Hk =$

1.0e-04 *

0.2739 0.3046
0.3046 0.3387

STEP 4

$dk =$

-60.4078
-67.1792

STEP 5

$ak =$

0.0022

$adk =$

-0.1338
-0.1488

$er =$

0.4494

STEP 6

$xk =$

-16.2994
-17.9999

$F_{k1} =$

-8.1500

----- ITERATION 3 -----
STEP 3

$gk =$

0.0049
-0.0044

$Jk =$

0.0049 -0.0044

$Hk =$

1.0e-04 *

0.4772 -0.4291
-0.4291 0.3859

STEP 4

$dk =$

-56.5957
50.8910

STEP 5

$ak =$

1.0000e-05

$adk =$

1.0e-03 *

-0.5660
0.5089

$er =$

5.5388e-04

Solution point:

$xs =$

-16.300007501945657
-17.999413346528229

Objective function at the solution point:

$fs =$

-8.149998557647706

Number of iterations performed:

$k =$

3

Prob 5.5 -- use a closer point so that it can be done manually

Produce the latex needed for final exam review document

```
syms x_1 x_2 x_3
f = (x_1+5)^2+(x_2+8)^2+(x_3+7)^2+2*x_1^2*x_2^2+4*x_1^2*x_3^2;
latex(f)
g = gradient(f);
latex(g)

steep_desc3('func55','grad55',[0; -8; -7],1e-3)

ans =

2\, {x_{1}}^2\, {x_{2}}^2 + 4\, {x_{1}}^2\, {x_{3}}^2 + {\left(x_{1} +
5\right)}^2 + {\left(x_{2} + 8\right)}^2 + {\left(x_{3} + 7\right)}^2

ans =

\left(\begin{array}{c} 4\, {x_{1}}\, {x_{2}}^2 + 8\, {x_{1}}\, {x_{3}}^2 +
2\, {x_{1}} + 10\, {x_{2}}\, {x_{1}}^2 + 2\, {x_{2}} + 16\, {x_{3}}\, {x_{1}}^2 + 2\, {x_{3}} + 14 \end{array}\right)

Program steep_desc3.m
----- ITERATION 1 -----
STEP 1

xk =

    0
   -8
   -7

STEP 2

gk =

    10
     0
     0

dk =
```



```
-10
  0
  0

STEP 3
Alpha: 0.001538462
STEP 4
  xk+1: -0.015384615
  xk+1: -8.000000000
  xk+1: -7.000000000
f(xk) = 2.492308e+01

xk =

  -0.0154
  -8.0000
  -7.0000

----- ITERATION 2 -----
STEP 2

gk =

  -0.0000
  -0.0076
  -0.0133

dk =

  0.0000
  0.0076
  0.0133

STEP 3
Alpha: 0.499585233
STEP 4

xk =

  -0.0154
  -7.9962
  -6.9934

----- ITERATION 3 -----
STEP 2

gk =

  0.0151
  -0.0000
  0.0000
```

```

dk =

    -0.0151
     0.0000
    -0.0000

STEP 3
Alpha: 0.001540793
STEP 4
Solution point:

xs =

    -0.015407926169005
    -7.996216155022361
    -6.993378280948492

Objective function at the solution point:

fs =

    24.923018533805848

Number of iterations performed:

k =

     3

ans =

    -0.0154
    -7.9962
    -6.9934

```

Chapter 7, using Prob 5.2 with DFP

- REMEMBER THAT CHAPTER 7 only has DFP and BFGS*
- DFP
- BFGS

```
dfp('func52','grad52',[-1; 1],1e-6);
```

```

Program dfp.m
----- ITERATION 1 -----
STEP 1

xk =

```

-1
1

$Sk =$

1 0
0 1

$gk =$

2
8

STEP 2

$dk =$

-2
-8

$ak =$

0.2576

$dtk =$

-0.5152
-2.0606

$xk_new =$

-1.5152
-1.0606

STEP 3

Norm of delta is 8.76 and epsi is 1.000000e-06

STEP 4

$gk_new =$

0.9697
-0.2424

$gmk =$

-1.0303
-8.2424

sg =

-1.0303
-8.2424

sw1 =

0.2654 1.0615
1.0615 4.2461

sw2 =

1.0615 8.4922
8.4922 67.9376

sw3 =

68.9991

Sk =

0.9998 -0.0625
-0.0625 0.2578

gk =

0.9697
-0.2424

----- ITERATION 2 -----
STEP 2

xk =

-1.5152
-1.0606

dk =

-0.9846
0.1231

ak =

0.4924

dtk =

-0.4848
0.0606

STEP 3

Norm of delta is 0.49 and epsi is 1.000000e-06

STEP 4

gk_new =

0
0

gmk =

-0.9697
0.2424

sg =

-0.9846
0.1231

sw1 =

0.2351 -0.0294
-0.0294 0.0037

sw2 =

0.9695 -0.1212
-0.1212 0.0151

sw3 =

0.9846

Sk =

0.5000 -0.0000
-0.0000 0.2500

gk =

```

0
0

----- ITERATION 3 -----
STEP 2

xk =

    -2
    -1

dk =

    0
    0

ak =

    1

dtk =

    0
    0

STEP 3
Norm of delta is 0.00 and epsi is 1.000000e-06
solution point:

xs =

    -2
    -1

objective function at the solution point:

fs =

    -6

number of iterations at convergence:

k =

    3

```

Chapter 7, using Prob 5.2 with BFGS

```
bfgs('func52','grad52',[-1; 1],1e-6);
```

```

Program bfgs.m
----- ITERATION 1 -----
STEP 1

xk =

    -1
     1

Sk =

     1     0
     0     1

gk =

     2
     8

STEP 2

dk =

    -2
    -8

ak =

    0.2576

dtk =

    -0.5152
    -2.0606

xk_new =

    -1.5152
    -1.0606

STEP 3
Norm of delta is 8.76 and epsi is 1.000000e-06
STEP 4

gk_new =

     0.9697
    -0.2424

```

*gm**k* =

-1.0303
-8.2424

D =

17.5152

sg =

-1.0303
-8.2424

*sw*1 =

| | |
|--------|--------|
| 0.2654 | 1.0615 |
| 1.0615 | 4.2461 |

*sw*2 =

| | |
|--------|---------|
| 0.5308 | 2.1230 |
| 4.2461 | 16.9844 |

Sk =

| | |
|---------|---------|
| 1.0142 | -0.0643 |
| -0.0643 | 0.2580 |

fk =

-5.7576

gk =

0.9697
-0.2424

----- Iteration 2 -----
STEP 2

dk =

-0.9991
0.1249

$ak =$

0.4853

$dtk =$

-0.4848

0.0606

STEP 3

Norm of delta is 0.49 and epsi is 1.000000e-06

STEP 4

$gk_new =$

0

0

$gm k =$

-0.9697

0.2424

$D =$

0.4848

$sg =$

-0.9991

0.1249

$sw1 =$

0.2351 -0.0294

-0.0294 0.0037

$sw2 =$

0.4844 -0.0606

-0.0606 0.0076

$Sk =$

0.5000 0.0000

```
0.0000    0.2500

fk =

    -6

gk =

     0
     0

----- Iteration 3 -----
STEP 2

dk =

     0
     0

ak =

     1

dtk =

     0
     0

STEP 3
Norm of delta is 0.00 and epsi is 1.000000e-06
solution point:

xs =

    -2
    -1

objective function at the solution point:

fs =

    -6

number of iterations at convergence:

k =

     3
```

Examples from the Internet --- Using DFP

$$f(x) = -2 * x_1^2 - 10 * x_2^2$$

```
dfp('funcNet1','gradNet1',[1; -1],1e-3);
```

Program dfp.m

----- ITERATION 1 -----

STEP 1

xk =

1
-1

Sk =

1 0
0 1

gk =

4
-20

STEP 2

dk =

-4
20

ak =

0.0577

dtk =

-0.2308
1.1538

xk_new =

0.7692
0.1538

STEP 3

Norm of delta is 10.58 and epsi is 1.000000e-03
STEP 4

$gk_{new} =$

3.0769
3.0769

$gmk =$

-0.9231
23.0769

$sg =$

-0.9231
23.0769

$sw1 =$

0.0533 -0.2663
-0.2663 1.3314

$sw2 =$

0.8521 -21.3018
-21.3018 532.5444

$sw3 =$

533.3964

$Sk =$

1.0004 0.0300
0.0300 0.0512

$gk =$

3.0769
3.0769

----- ITERATION 2 -----
STEP 2

$xk =$

0.7692
0.1538

$dk =$

-3.1705
-0.2499

$ak =$

0.2699

$dtk =$

-0.8556
-0.0674

STEP 3

Norm of delta is 1.33 and epsi is 1.000000e-03

STEP 4

$gk_{new} =$

-0.3456
1.7281

$gm_k =$

-3.4225
-1.3488

$sg =$

-3.4644
-0.1718

$sw1 =$

| | |
|--------|--------|
| 0.7321 | 0.0577 |
| 0.0577 | 0.0045 |

$sw2 =$

| | |
|---------|--------|
| 12.0017 | 0.5951 |
| 0.5951 | 0.0295 |

```

sw3 =

    12.0886

Sk =

    0.2500    -0.0001
   -0.0001     0.0503

gk =

   -0.3456
    1.7281

----- ITERATION 3 -----
STEP 2

xk =

   -0.0864
    0.0864

dk =

    0.0866
   -0.0869

ak =

    0.9949

dtk =

    0.0862
   -0.0865

STEP 3
Norm of delta is 0.12 and epsi is 1.000000e-03
STEP 4

gk_new =

    1.0e-03 *

   -0.9953
   -0.9953

gmk =

```

0.3446
-1.7291

sg =

0.0864
-0.0870

sw1 =

0.0074 -0.0074
-0.0074 0.0075

sw2 =

0.0075 -0.0075
-0.0075 0.0076

sw3 =

0.1801

Sk =

0.2501 0.0000
0.0000 0.0500

gk =

1.0e-03 *
-0.9953
-0.9953

----- ITERATION 4 -----
STEP 2

xk =

1.0e-03 *
-0.2488
-0.0498

dk =

```

1.0e-03 *

0.2489
0.0498

ak =

0.9997

dtk =

1.0e-03 *

0.2488
0.0498

STEP 3
Norm of delta is 0.00 and epsi is 1.000000e-03
solution point:

xs =

1.0e-10 *

0.458617078233185
-0.458617078910812

objective function at the solution point:

fs =

2.523955499581143e-20

number of iterations at convergence:

k =

4

```

USING BFGS

```
bfgs('funcNet1','gradNet1',[-1; 1],1e-6);
```

```

Program bfgs.m
----- ITERATION 1 -----
STEP 1

xk =

```


-1
1

$S_k =$

1 0
0 1

$g_k =$

-4
20

STEP 2

$dk =$

4
-20

$ak =$

0.0577

$dtk =$

0.2308
-1.1538

$xk_{new} =$

-0.7692
-0.1538

STEP 3

Norm of delta is 10.58 and epsi is 1.000000e-06

STEP 4

$gk_{new} =$

-3.0769
-3.0769

$gmk =$

0.9231
-23.0769

$D =$

26.8402

$sg =$

0.9231
-23.0769

$sw1 =$

0.0533 -0.2663
-0.2663 1.3314

$sw2 =$

0.2130 -1.0651
-5.3254 26.6272

$Sk =$

1.0255 0.0310
0.0310 0.0512

$fk =$

1.4201

$gk =$

-3.0769
-3.0769

----- Iteration 2 -----
STEP 2

$dk =$

3.2510
0.2531

$ak =$

0.2634

$dtk =$

0.8564
0.0667

STEP 3

Norm of delta is 1.33 and epsi is 1.000000e-06

STEP 4

$gk_{new} =$

0.3487
-1.7434

$gmk =$

3.4256
1.3336

$D =$

3.0226

$sg =$

3.5545
0.1746

$sw1 =$

0.7334 0.0571
0.0571 0.0044

$sw2 =$

3.0440 0.2370
0.1495 0.0116

$Sk =$

0.2502 -0.0004
-0.0004 0.0510

$fk =$

0.0912

```
gk =  
    0.3487  
   -1.7434  
  
----- Iteration 3 -----  
STEP 2  
  
dk =  
   -0.0879  
    0.0891  
  
ak =  
    0.9801  
  
dtk =  
   -0.0862  
    0.0874  
  
STEP 3  
Norm of delta is 0.12 and epsi is 1.000000e-06  
STEP 4  
  
gk_new =  
    0.0039  
    0.0039  
  
gmk =  
   -0.3447  
    1.7473  
  
D =  
    0.1824  
  
sg =  
   -0.0870  
    0.0893  
  
sw1 =
```

```

    0.0074    -0.0075
  -0.0075     0.0076

```

sw2 =

```

    0.0075    -0.0076
  -0.0077     0.0078

```

Sk =

```

    0.2503     0.0001
    0.0001     0.0500

```

fk =

```

  2.3119e-06

```

gk =

```

    0.0039
    0.0039

```

```

----- Iteration 4 -----
STEP 2

```

dk =

```

  1.0e-03 *
  -0.9827
  -0.1965

```

ak =

```

  0.9988

```

dtk =

```

  1.0e-03 *
  -0.9815
  -0.1963

```

STEP 3

Norm of delta is 0.00 and epsi is 1.000000e-06

STEP 4

gk_new =

$1.0e-07 *$

-0.1104
 0.5521

$gmk =$

-0.0039
 -0.0039

$D =$

$4.6239e-06$

$sg =$

$1.0e-03 *$
 -0.9827
 -0.1965

$sw1 =$

$1.0e-06 *$
 $0.9633 \quad 0.1927$
 $0.1927 \quad 0.0385$

$sw2 =$

$1.0e-06 *$
 $0.9645 \quad 0.1929$
 $0.1929 \quad 0.0386$

$Sk =$

$0.2500 \quad -0.0000$
 $-0.0000 \quad 0.0500$

$fk =$

$9.1441e-17$

$gk =$

```
1.0e-07 *  
  
-0.1104  
0.5521  
  
----- Iteration 5 -----  
STEP 2  
  
dk =  
  
1.0e-08 *  
  
0.2760  
-0.2760  
  
ak =  
  
1  
  
dtk =  
  
1.0e-08 *  
  
0.2760  
-0.2760  
  
STEP 3  
Norm of delta is 0.00 and epsi is 1.000000e-06  
solution point:  
  
xs =  
  
1.0e-16 *  
  
0.873078308755502  
-0.873093036706309  
  
objective function at the solution point:  
  
fs =  
  
9.147445973889177e-32  
  
number of iterations at convergence:  
  
k =  
  
5
```

Using Gauss-Newton

```
gauss_newton('funcNet1','gradNet1','jacobNet1',[1; -1],1e-3);
```

Program gauss_newton.m

----- ITERATION 1 -----

STEP 1

$x_k =$

1
-1

STEP 2

$F_k =$

12

STEP 3

$g_k =$

4
-20

$J_k =$

1.4142 0
0 3.1623

$H_k =$

4.0000 0
0 20.0000

STEP 4

$dk =$

-1.0000
1.0000

STEP 5

$ak =$

1

STEP 6


```

adk =

    -1.0000
     1.0000

er =

    1.4142

STEP 6

xk =

    1.0e-12 *

    0.2502
   -0.0501

F_k1 =

    1.5032e-25

----- ITERATION 2 -----
STEP 3

gk =

    1.0e-11 *

    0.1001
   -0.1001

Jk =

    1.4142      0
      0    3.1623

Hk =

    4.0000      0
      0    20.0000

STEP 4

dk =

    1.0e-12 *

   -0.2502

```

```

0.0501

STEP 5

ak =

1

adk =

1.0e-12 *

-0.2502
0.0501

er =

12

STEP 6

xk =

1.0e-25 *

0.6260
-0.0251

F_k1 =

7.9013e-51

----- ITERATION 3 -----
STEP 3

gk =

1.0e-24 *

0.2504
-0.0501

Jk =

1.4142      0
0      3.1623

Hk =

```

```

4.0000      0
      0  20.0000

```

STEP 4

dk =

```

1.0e-25 *
-0.6260
 0.0251

```

STEP 5

ak =

```

1

```

adk =

```

1.0e-25 *
-0.6260
 0.0251

```

er =

```

1.5032e-25

```

Solution point:

xs =

```

1.0e-37 *
 0.156694315319573
-0.001255563424035

```

Objective function at the solution point:

fs =

```

4.912198130205698e-76

```

Number of iterations performed:

k =

```

3

```

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